Characterizing land surface phenologies in the highlands of Kyrgyzstan through synergistic use of Landsat and MODIS data

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The Caucasus and Central Asia Minsk Moscow Nizhniy Novgorod Novosibirsk BELARUS *Yekaterinburg Omsk Chelyabinsk Ufa Kiev Samara Pavlodar (Kostanay) Saratov Astana Semey UKRAINE *Qaraghandy (Karaganda) Donets'k *Aqtöbe (Aktobe) Volgograd Sea of KAZAKHSTAN Karamay Azov Atyraŭ •(Atyrau) Sevastopol Saryshaghan (Saryshagan) Astrakhan' Baykonur Cosmodrome Black Sea Almaty Qyzylorda (Kyzyorda) Groznyy. Sokhumi Aqtau (Aktau) Taraz_ Bishkek Aksu Bat'umi GEORGIA Shymkent, KYRGYZSTAN Trabzon Nukus Caspian Tashke ARMENIA Sea CHINA TURKEY AZERBAIJAN **UZBEKISTAN** Türkmenbashy Nebitdag TURKMENISTAN Bukhoro DushanbeTAJIKISTAN Turkmenaba *Tabriz Ashgabat SYRIA Mary PAKISTAN Line of Colors of control Tehrān IRAQ Kabul, Scale 1:19,000,000 JORDAN De Facto INDIA Lambert Conformal Conic Projection, **AFGHANISTAN** Value of a male servine Rev Islāmābād Bagindad

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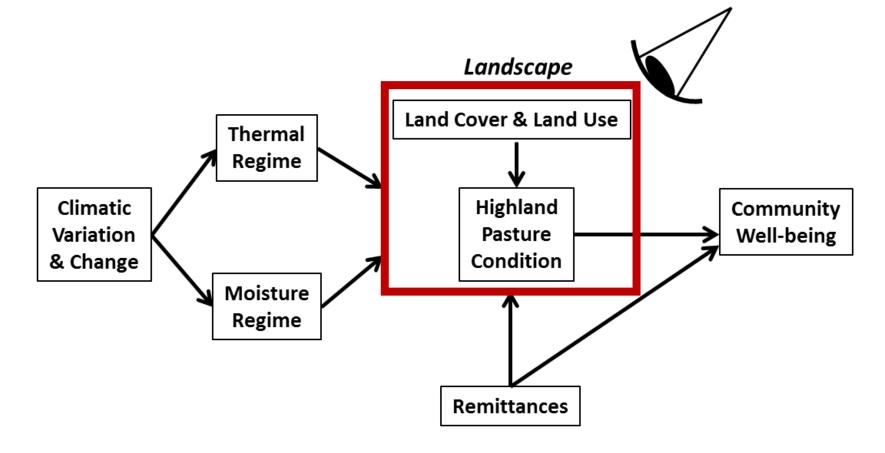
Boundary representation is

SAUDI



km²), but Kyrgyzstan is very mountainous (94%) and more populous (~6M vs. <1M).





Fundamental question: Can the change of pasture condition can be detected through remote sensing and linked to community well-being through econometric and structural equation modeling?

Ancillary question: Can the drivers of change of pasture condition be addressed through remote sensing of land surface phenology (vegetation indices) and land surface seasonality (snow cover metrics)?



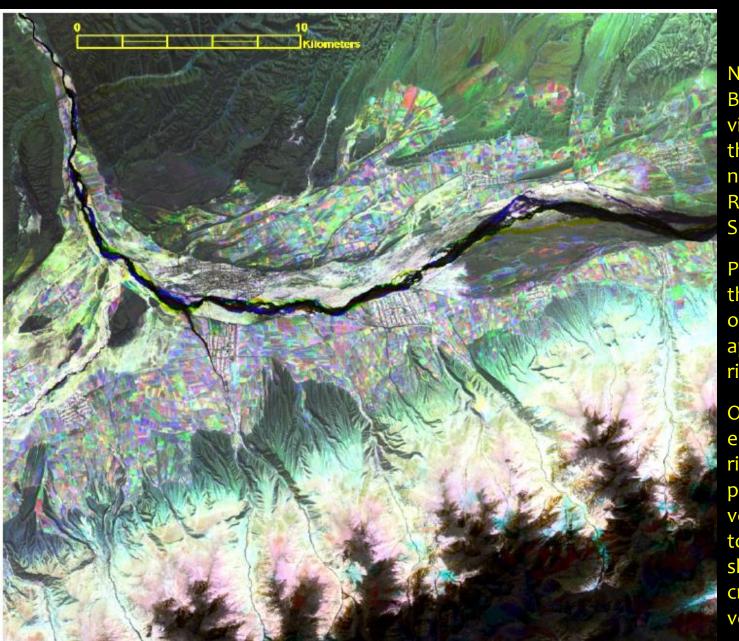
Initial Synthesis

[I] Increasing temperatures reduce snow cover duration may shift the growing season earlier and extend it longer in high mountain pastures, but the increasing temperatures may also reduce seasonal forage production due to reduced soil moisture resulting from higher evapotranspiration.

[II] Increased remittances lead to increased livestock and more grazing pressures on nearby pastures, but may not have increased grazing in remote highland pastures since 1991, which, in turn, leads to the declined status of lower pastures nearby human settlements and improved status of more remote pastures at higher elevations.



Livelihoods poised between cold and dry



NDVI composite of L5 TM & L7 ETM+ scenes:

23AUG2002 (L7) 02SEP2000 (L7) 06SEP2010 (L5)

Naryn oblast showing At-Bashi & surrounding villages on either bank of the At-Bashi River, just north of the At-Bashi Ridge in the Central Tien-Shan.

Persistent snow cover on the north-facing slopes of the At-Bashi Ridge appears dark (lower right).

Other dark areas indicate either open water (e.g., river) or areas of persistently low vegetation (e.g., drylands to the top left and barren slopes between the croplands and the vegetated slopes).

Phenology is the study of

- i. the timing of recurring biological events,
- ii. the causes of their timing,
- iii. their relationship to biotic and abiotic forces, and
- iv. the inter-relations among phases of the same or different species.

US/IBP Phenology Committee, 1973

Some Useful Distinctions & Categories

- Phenology: Biotic patterns :: Seasonality: Abiotic patterns
 But seasonality can affect phenology and vice versa.
- Land surface phenology is distinct from organismal phenology: observing electromagnetic radiation at coarse spatial resolution results in a mixture of signals that combines biotic and abiotic components.
- X LSPs are the seasonal spatio-temporal patterns of the vegetated land surface.
- LSPs affect the timing and magnitude of energy and water exchanges between the land surface and the boundary layer.

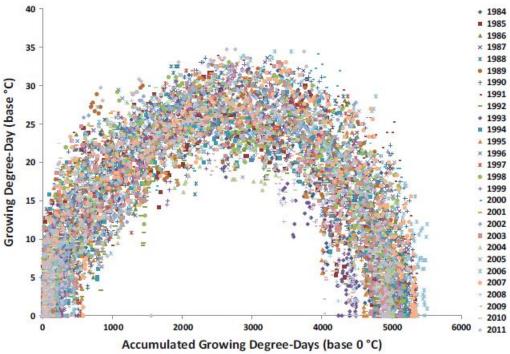
We track the progression of the growing season using **Accumulated Growing Degree-Days** (also known as **thermal time**) is a simple biometeorological variable that weights the passage of days by the quantity of "growing degrees" – that portion of the diel temperature range that is useful for plant growth, broadly construed.

The calculation of AGDD is straightforward:

(1)
$$AvgTemp_t = (MaxTemp_t + MinTemp_t)/2$$

(2)
$$AGDD_t = AGDD_{t-1} + max[(AvgTemp_t - Base), o]$$

Base = 0 °C and accumulation resets 01JAN.

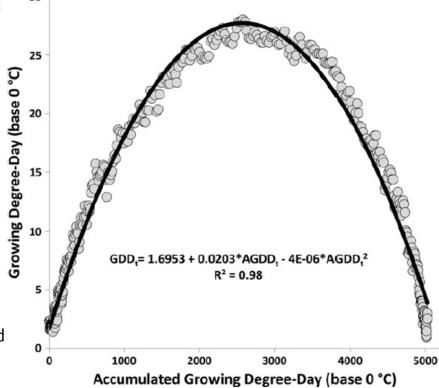


Mean GDD (base o °C) as a function of AGDD for Manhattan, KS 1984-2011 →

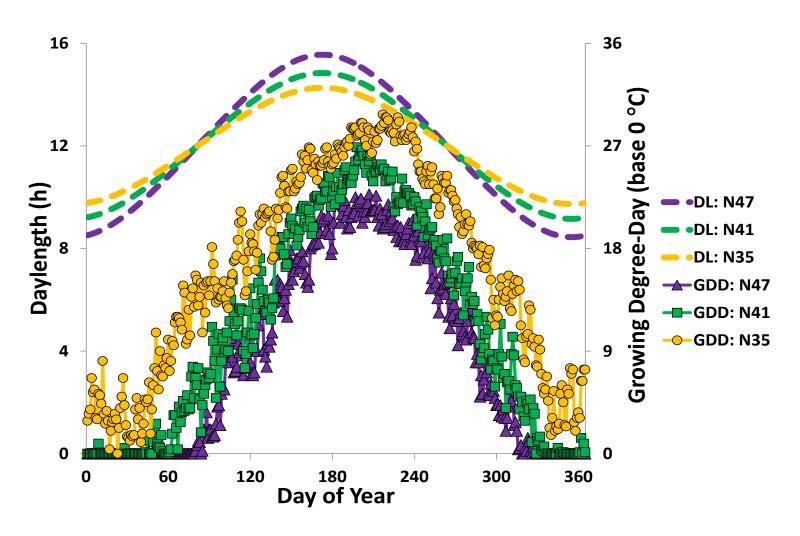
To build LSP models we want to take advantage of the natural clock of insolation at mid-latitudes.

Henebry GM. 2013. Phenologies of North American Grasslands and Grasses. In: (MD Schwartz, ed.) **Phenology: An Integrative Environmental Science, 2e**. Springer. Chapter 11, pp. 197-210.

← Growing degree-days (base o °C) as a function of accumulated growing degree-days (AGDD) for Manhattan, KS 1984-2011



Both insolation and growing degree-days exhibit simple shapes across the middle latitudes



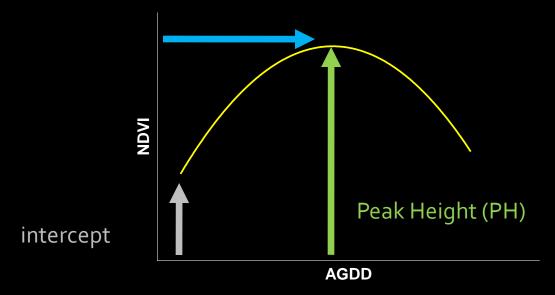
Henebry GM. 2013. Phenologies of North American Grasslands and Grasses. In: (MD Schwartz, ed.) **Phenology: An Integrative Environmental Science, 2e**. Springer. Chapter 11, pp. 197-210.

The Convex Quadratic (CxQ) LSP model links a VI (e.g., NDVI, WDRVI, EVI) to the temporal progression of accumulated growing degree-days (AGDD) and it has been successfully applied to a variety of settings and scales.

NDVI =
$$\alpha + \beta*AGDD - \gamma*AGDD^2$$

PH = $\alpha - (\beta^2/4\gamma)$
TTP = $-\beta/2\gamma$

Thermal Time to Peak (TTP)



NDVI from Landsat AGDD from MODIS

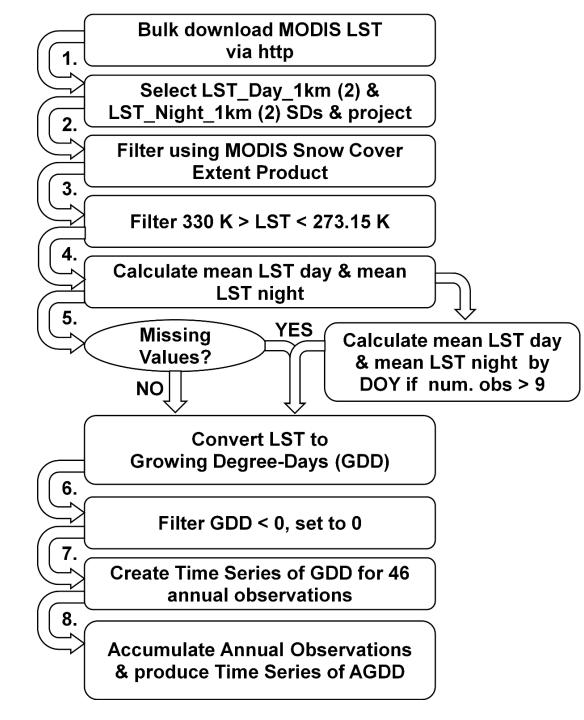
Processing chain for converting MODIS LST into Accumulated Growing Degree-Days (AGDD)

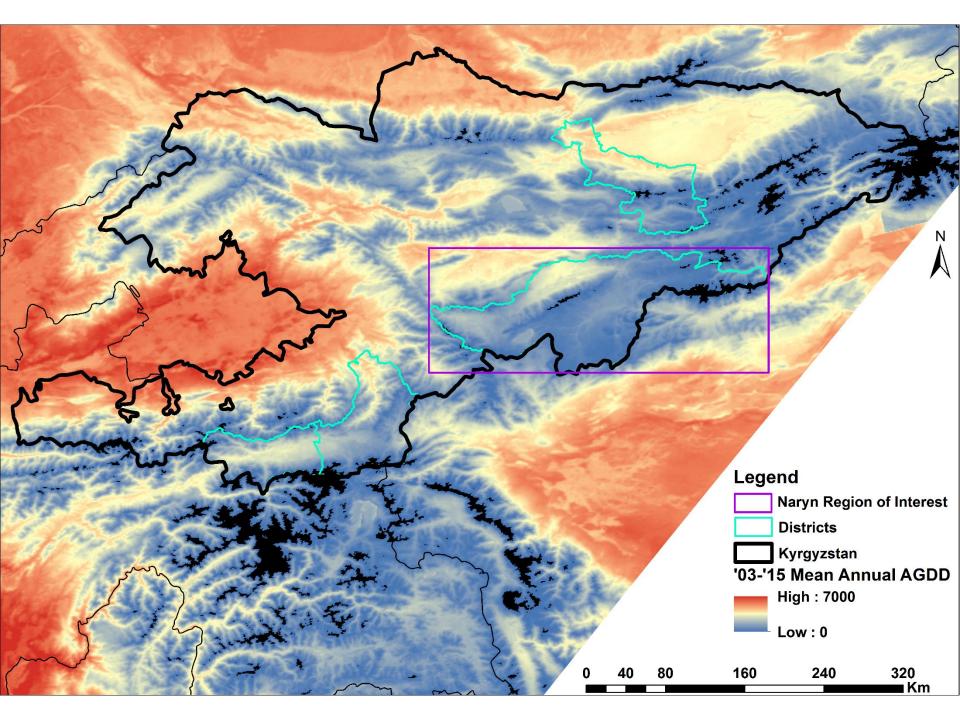
GDD = max [(AvgTemp-BaseTemp), o]

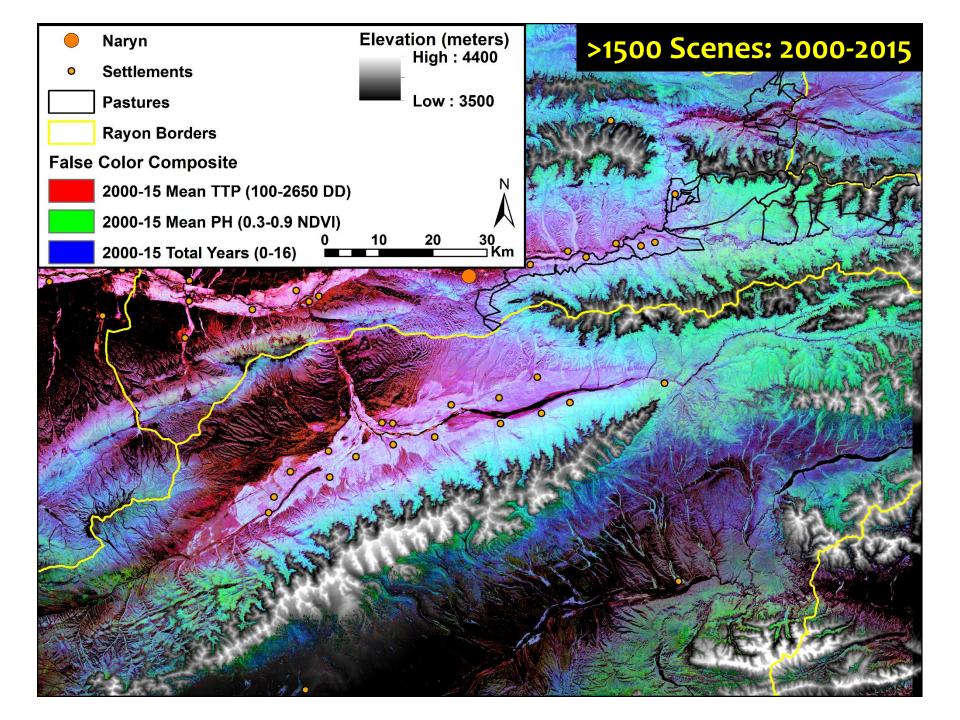
BaseTemp = o °C

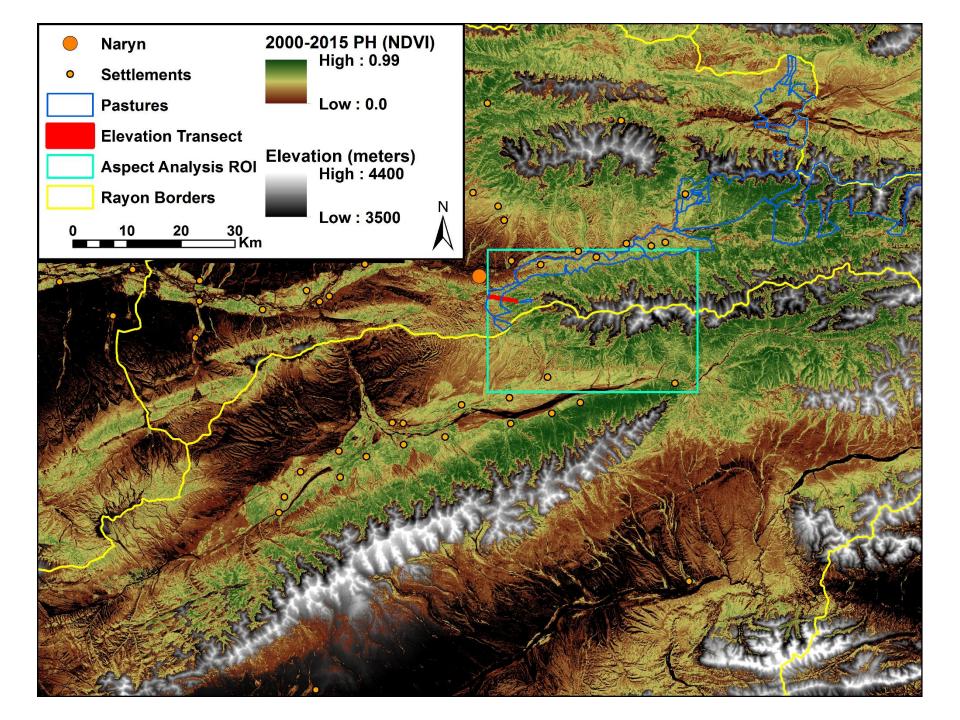
Krehbiel CP, GM Henebry. 2016. A Comparison of Multiple Datasets for Monitoring Thermal Time in Urban Areas over the U.S. Upper Midwest. *Remote Sensing* 8:297.

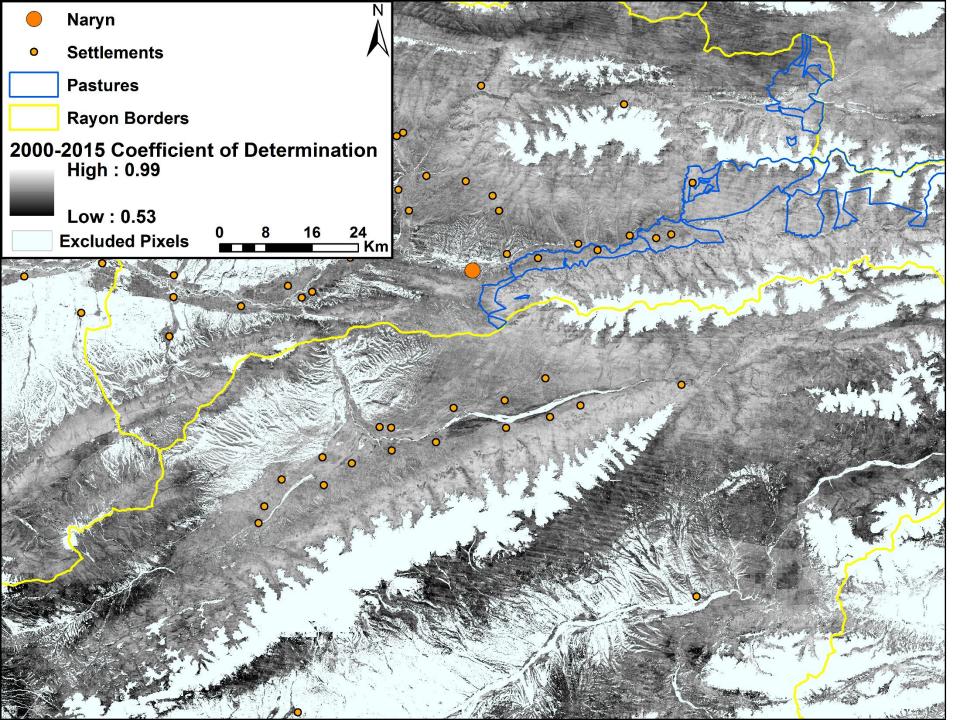
http://doi.org/10.3390/rs8040297

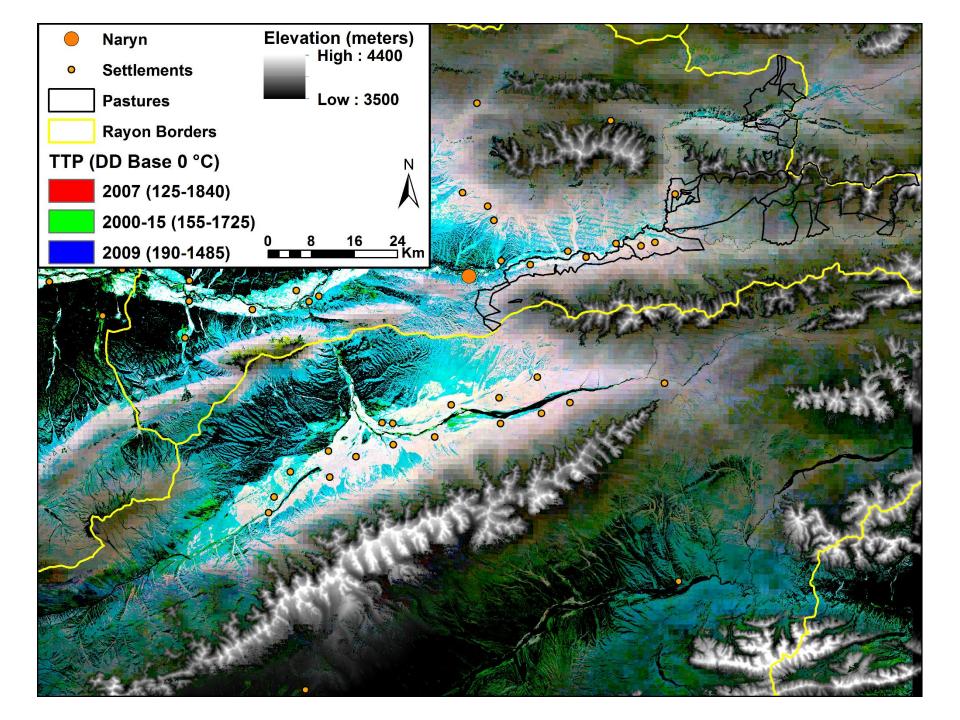


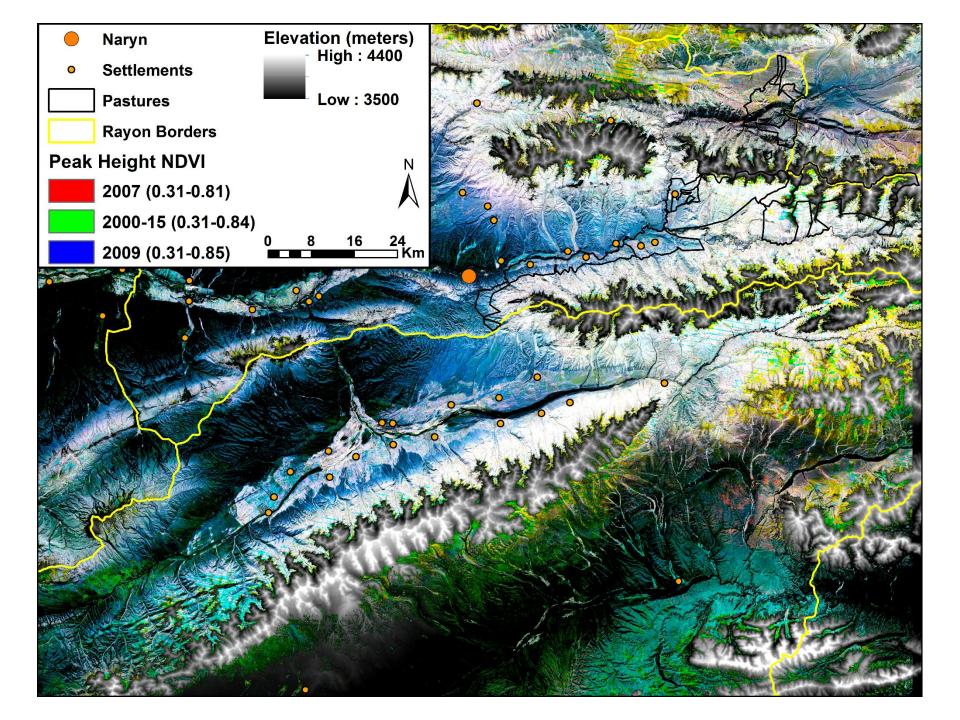












Explaining the maps to members of the local pasture committee...



Enjoying Kyrgyz hospitality, including many cups of kumis ...



